## Woebot\_notebookRun

## July 5, 2020

```
[1]: # Importing Main Libraries
   import torch
   torch.cuda.current_device()
   import numpy as np
   from torch.utils.data import DataLoader
   from preprocess_load_embedding import EmpathyDataset, DataPreprocessing
   from sklearn.model_selection import train_test_split
   import torch.backends.cudnn as cudnn
   from models_LSTMs import LSTM_fixed_len, LSTM_variable_input, LSTM_glove_vecs
   from train_test_lossCriterion import train, get_optimizer_criterion_scheduler
   import warnings
   warnings.filterwarnings('ignore')
   np.random.seed(1)
    # Model was trained using GPU in CUDA Environment
   print("Cuda Available: {}".format(torch.cuda.is_available()))
    # File Names
   labelled_message_file = "/media/HDD_2TB.1/machine-learning-engineer/
     →labeled_messages.csv"
    empathies_file = "/media/HDD_2TB.1/machine-learning-engineer/empathies.csv"
   [nltk_data] Downloading package stopwords to
                   /home/akashdevgun/nltk_data...
   [nltk_data]
   [nltk_data]
                 Package stopwords is already up-to-date!
   Cuda Available: True
[2]: # Method that calls to train different types of LSTMs
   def train_lstms(model, num_epochs, learning_rate, loss_weights, device, u
     →train_queue, valid_queue):
       model = model.to(device)
       criterion, optimizer, scheduler = get_optimizer_criterion_scheduler(model,_
     →num_epochs, learning_rate,
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→loss_weights, device)
        for epoch in range(num_epochs):
            scheduler.step()
            train(model, device, train_queue, valid_queue, optimizer, epoch,_
     →criterion)
[3]: # Main Method
    def main():
        # Object 'Data' is created by Class Named -> 'DataPreprocessing' with file
     \rightarrownames as parameters
        data = DataPreprocessing(labelled_message_file, empathies_file)
        # Method Call describes number of words in Corpus, messages lengths
        data.describe counts()
        # Method call for MultiLabel Encoding, for weighted label weights to handle_
     \rightarrow imbalance
        output_size, loss_weights = data.label_binarizer_get_weights()
        # CAll to Get X and Y
        X = data.get_X_data()
        y = data.get_Y_data()
        print('\n')
        # Train and Test Split
        X_train, X_valid, y_train, y_valid = train_test_split(X, y, test_size=0.3)
        # Baseline Classifier using SVC to calculate Accuracy and Area Under Curve
     \rightarrow Scores
        print("***** Baseline AUC Scores *****")
        acc_svm, roc_svm = data.modelling("SVC", X_train, X_valid, y_train, y_valid)
        print("SVM Modelling --> Validation Acc. : %.3f, Validation AUC Score : %.
     →3f" % (acc_svm, roc_svm))
        acc_RF, roc_RF = data.modelling("RandomForest", X_train, X_valid, y_train, u
     →y_valid)
        print("***** Statistical Method better then Baseline ****")
        # Baseline Classifier using SVC to calculate Accuracy and Area Under Curve_
     \hookrightarrow Scores
        print("Random Forest Modelling --> Validation Acc. : %.3f, Validation AUC⊔
     →Score : %.3f" % (acc_RF, roc_RF))
        # Class 'EmpathyDataset' Called for train and valid dataset to load while_
     →run time during training and testing
        train_ds = EmpathyDataset(X_train, y_train)
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valid_ds = EmpathyDataset(X_valid, y_valid)
       vocab_size = len(data.words)
       num_epochs = 1001
       batch_size = 1000
       learning_rate = 0.3
       # Data Loader for train and test
       train_queue = DataLoader(train_ds, batch_size=batch_size, shuffle=True)
       valid_queue = DataLoader(valid_ds, batch_size=batch_size, shuffle=False)
       # CUDA Environment Settings
       torch.cuda.set_device(0)
       cudnn.benchmark = True
       torch.manual seed(1)
       cudnn.enabled = True
       torch.cuda.manual_seed(1)
       use_cuda = torch.cuda.is_available()
       device = torch.device("cuda" if use_cuda else "cpu")
       \# LSTMs models with fixed length Input, variable length Input, using
    \rightarrowStandFord Glove Representations
       print('\n')
       print('-----')
       model1 = LSTM_fixed_len(vocab_size, 48, 96, output_size)
       train_lstms(model1, num_epochs, learning_rate, loss_weights, device, __
    →train_queue, valid_queue)
       print('\n')
       print('-----')
       model2 = LSTM_variable_input(vocab_size, 48, 96, output_size)
       train_lstms(model2, num_epochs, learning_rate, loss_weights, device, __
    →train_queue, valid_queue)
       print('\n')
       print('-----LSTMs with Glove Representation of Input-----')
       word_vecs = data.load_glove_vectors()
       pretrained_weights, vocab, vocab2index = data.get_emb_matrix(word_vecs)
       model3 = LSTM_glove_vecs(vocab_size, 50, 96, pretrained_weights, output_size)
       train_lstms(model3, num_epochs, learning_rate, loss_weights, device, u
    →train_queue, valid_queue)
[4]: | if __name__ == '__main__':
       main()
   Data Shape: (3562, 4)
   First 5 Columns of Data:
                                   empathy ignore
     num_seen
                       message
```

0	2884	tired	1	tired	${\tt NaN}$
1	253	exhausted	1	tired	${\tt NaN}$
2	61	drained	1	tired	${\tt NaN}$
3	31	tired but happy	tired, l	ларру	${\tt NaN}$
4	30	im tired	1	tired	${\tt NaN}$

Number of words in Corpus: 2114

Message Avg Length: 5.123526108927569, Message Max Length: 121

Number of Empathies: 62, Output Shape is: (3562, 62)

First 5 Columns of Data After Preprocessing and MultiLabel Encoding:

	num_seen	message	empathy	${\tt message\_length}$	\
0	2884	tired	tired	1	
1	253	exhausted	tired	1	
2	61	drained	tired	1	
3	31	tired but happy	tired, happy	3	
4	30	i am tired	tired	3	

'	y_encoded	encoded	e:														
	[tired]	, 0,	Ο,	[[2,	0												
	[tired]	, 0,	Ο,	[[3,	1												
	[tired]	, 0,	Ο,	[[4,	2												
	[tired, happy]	, 0,	Ο,	6,	5,	[[2,	3										
	[tired]	, 0,	Ο,	2,	8,	[[7,	4										

## y\_encoded\_int

```
**** Baseline AUC Scores ****
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SVM Modelling --> Validation Acc.: 0.972, Validation AUC Score: 0.606 \*\*\*\* Statistical Method better then Baseline \*\*\*\*

Random Forest Modelling --> Validation Acc. : 0.892, Validation AUC Score : 0.685

Epoch: 1, Train loss: 0.676, Val loss: 0.668, Val Acc: 0.621, Val AUC\_ROC Macro: 0.488, Val AUC\_ROC Weighted: 0.488, Val Recall Macro: 0.474, Val Precision

Weighted: 0.955, Val Ham Loss: 0.379

<sup>-----</sup>LSTMs Fixed Length Input-----

```
Epoch: 101, Train loss: 0.002, Val loss: 0.002, Val Acc: 0.978, Val AUC_ROC
Macro: 0.634, Val AUC_ROC Weighted: 0.634, Val Recall Macro: 0.500, Val
Precision Weighted: 0.957, Val Ham Loss: 0.022
Epoch: 201, Train loss: 0.002, Val loss: 0.002, Val Acc: 0.978, Val AUC_ROC
Macro: 0.677, Val AUC_ROC Weighted: 0.677, Val Recall Macro: 0.500, Val
Precision Weighted: 0.957, Val Ham Loss: 0.022
Epoch: 301, Train loss: 0.002, Val loss: 0.002, Val Acc: 0.978, Val AUC_ROC
Macro: 0.695, Val AUC_ROC Weighted: 0.695, Val Recall Macro: 0.500, Val
Precision Weighted: 0.957, Val Ham Loss: 0.022
Epoch: 401, Train loss: 0.002, Val loss: 0.002, Val Acc: 0.978, Val AUC_ROC
Macro: 0.704, Val AUC_ROC Weighted: 0.704, Val Recall Macro: 0.500, Val
Precision Weighted: 0.957, Val Ham Loss: 0.022
Epoch: 501, Train loss: 0.002, Val loss: 0.002, Val Acc: 0.978, Val AUC_ROC
Macro: 0.706, Val AUC_ROC Weighted: 0.706, Val Recall Macro: 0.500, Val
Precision Weighted: 0.957, Val Ham Loss: 0.022
Epoch: 601, Train loss: 0.002, Val loss: 0.002, Val Acc: 0.978, Val AUC_ROC
Macro: 0.709, Val AUC_ROC Weighted: 0.709, Val Recall Macro: 0.500, Val
Precision Weighted: 0.957, Val Ham Loss: 0.022
Epoch: 701, Train loss: 0.002, Val loss: 0.002, Val Acc: 0.978, Val AUC_ROC
Macro: 0.711, Val AUC_ROC Weighted: 0.711, Val Recall Macro: 0.500, Val
Precision Weighted: 0.957, Val Ham Loss: 0.022
Epoch: 801, Train loss: 0.002, Val loss: 0.002, Val Acc: 0.978, Val AUC_ROC
Macro: 0.712, Val AUC_ROC Weighted: 0.712, Val Recall Macro: 0.500, Val
Precision Weighted: 0.957, Val Ham Loss: 0.022
Epoch: 901, Train loss: 0.002, Val loss: 0.002, Val Acc: 0.978, Val AUC_ROC
Macro: 0.712, Val AUC_ROC Weighted: 0.712, Val Recall Macro: 0.500, Val
Precision Weighted: 0.957, Val Ham Loss: 0.022
Epoch: 1001, Train loss: 0.002, Val loss: 0.002, Val Acc: 0.978, Val AUC_ROC
Macro: 0.713, Val AUC_ROC Weighted: 0.713, Val Recall Macro: 0.500, Val
Precision Weighted: 0.957, Val Ham Loss: 0.022
```

-----LSTMs Variable Length Input-----

Epoch: 1, Train loss: 0.683, Val loss: 0.676, Val Acc: 0.530, Val AUC\_ROC Macro: 0.501, Val AUC\_ROC Weighted: 0.501, Val Recall Macro: 0.498, Val Precision Weighted: 0.957, Val Ham Loss: 0.470

Epoch: 101, Train loss: 0.011, Val loss: 0.011, Val Acc: 0.978, Val AUC\_ROC Macro: 0.488, Val AUC\_ROC Weighted: 0.488, Val Recall Macro: 0.500, Val Precision Weighted: 0.957, Val Ham Loss: 0.002

Epoch: 201, Train loss: 0.009, Val loss: 0.010, Val Acc: 0.978, Val AUC\_ROC Macro: 0.487, Val AUC\_ROC Weighted: 0.487, Val Recall Macro: 0.500, Val Precision Weighted: 0.957, Val Ham Loss: 0.002

Epoch: 301, Train loss: 0.009, Val loss: 0.009, Val Acc: 0.978, Val AUC\_ROC Macro: 0.487, Val AUC\_ROC Weighted: 0.487, Val Recall Macro: 0.500, Val Precision Weighted: 0.957, Val Ham Loss: 0.002

Epoch: 401, Train loss: 0.008, Val loss: 0.009, Val Acc: 0.978, Val AUC\_ROC Macro: 0.488, Val AUC\_ROC Weighted: 0.488, Val Recall Macro: 0.500, Val Precision Weighted: 0.957, Val Ham Loss: 0.009, Val Recall Macro: 0.500, Val Precision Weighted: 0.957, Val Ham Loss: 0.009, Val Recall Macro: 0.500, Val Precision Weighted: 0.957, Val Ham Loss: 0.022

Epoch: 501, Train loss: 0.008, Val loss: 0.009, Val Acc: 0.978, Val AUC\_ROC Macro: 0.490, Val AUC\_ROC Weighted: 0.490, Val Recall Macro: 0.500, Val Precision Weighted: 0.957, Val Ham Loss: 0.022 Epoch: 601, Train loss: 0.008, Val loss: 0.009, Val Acc: 0.978, Val AUC\_ROC Macro: 0.491, Val AUC\_ROC Weighted: 0.491, Val Recall Macro: 0.500, Val Precision Weighted: 0.957, Val Ham Loss: 0.022 Epoch: 701, Train loss: 0.008, Val loss: 0.009, Val Acc: 0.978, Val AUC\_ROC Macro: 0.492, Val AUC\_ROC Weighted: 0.492, Val Recall Macro: 0.500, Val Precision Weighted: 0.957, Val Ham Loss: 0.022 Epoch: 801, Train loss: 0.008, Val loss: 0.009, Val Acc: 0.978, Val AUC\_ROC Macro: 0.492, Val AUC\_ROC Weighted: 0.492, Val Recall Macro: 0.500, Val Precision Weighted: 0.957, Val Ham Loss: 0.022 Epoch: 901, Train loss: 0.008, Val loss: 0.009, Val Acc: 0.978, Val AUC\_ROC Macro: 0.493, Val AUC\_ROC Weighted: 0.493, Val Recall Macro: 0.500, Val Precision Weighted: 0.957, Val Ham Loss: 0.022 Epoch: 1001, Train loss: 0.008, Val loss: 0.009, Val Acc: 0.978, Val AUC\_ROC Macro: 0.493, Val AUC\_ROC Weighted: 0.493, Val Recall Macro: 0.500, Val Precision Weighted: 0.957, Val Ham Loss: 0.022

-----LSTMs with Glove Representation of Input-----Epoch: 1, Train loss: 0.682, Val loss: 0.674, Val Acc: 0.579, Val AUC\_ROC Macro: 0.523, Val AUC\_ROC Weighted: 0.523, Val Recall Macro: 0.528, Val Precision Weighted: 0.959, Val Ham Loss: 0.421 Epoch: 101, Train loss: 0.002, Val loss: 0.002, Val Acc: 0.978, Val AUC\_ROC Macro: 0.614, Val AUC\_ROC Weighted: 0.614, Val Recall Macro: 0.500, Val Precision Weighted: 0.957, Val Ham Loss: 0.022 Epoch: 201, Train loss: 0.002, Val loss: 0.002, Val Acc: 0.978, Val AUC\_ROC Macro: 0.657, Val AUC\_ROC Weighted: 0.657, Val Recall Macro: 0.500, Val Precision Weighted: 0.957, Val Ham Loss: 0.022 Epoch: 301, Train loss: 0.002, Val loss: 0.002, Val Acc: 0.978, Val AUC\_ROC Macro: 0.679, Val AUC\_ROC Weighted: 0.679, Val Recall Macro: 0.500, Val Precision Weighted: 0.957, Val Ham Loss: 0.022 Epoch: 401, Train loss: 0.002, Val loss: 0.002, Val Acc: 0.978, Val AUC\_ROC Macro: 0.698, Val AUC\_ROC Weighted: 0.698, Val Recall Macro: 0.500, Val Precision Weighted: 0.957, Val Ham Loss: 0.022 Epoch: 501, Train loss: 0.002, Val loss: 0.002, Val Acc: 0.978, Val AUC\_ROC Macro: 0.710, Val AUC\_ROC Weighted: 0.710, Val Recall Macro: 0.500, Val Precision Weighted: 0.957, Val Ham Loss: 0.022 Epoch: 601, Train loss: 0.002, Val loss: 0.002, Val Acc: 0.978, Val AUC\_ROC Macro: 0.711, Val AUC\_ROC Weighted: 0.711, Val Recall Macro: 0.500, Val Precision Weighted: 0.957, Val Ham Loss: 0.022 Epoch: 701, Train loss: 0.002, Val loss: 0.002, Val Acc: 0.978, Val AUC\_ROC Macro: 0.712, Val AUC\_ROC Weighted: 0.712, Val Recall Macro: 0.500, Val Precision Weighted: 0.957, Val Ham Loss: 0.022 Epoch: 801, Train loss: 0.002, Val loss: 0.002, Val Acc: 0.978, Val AUC\_ROC Macro: 0.712, Val AUC\_ROC Weighted: 0.712, Val Recall Macro: 0.500, Val Precision Weighted: 0.957, Val Ham Loss: 0.022

Epoch: 901, Train loss: 0.002, Val loss: 0.002, Val Acc: 0.978, Val AUC\_ROC Macro: 0.711, Val AUC\_ROC Weighted: 0.711, Val Recall Macro: 0.500, Val

Precision Weighted: 0.957, Val Ham Loss: 0.022

Epoch: 1001, Train loss: 0.002, Val loss: 0.002, Val Acc: 0.978, Val AUC\_ROC Macro: 0.711, Val AUC\_ROC Weighted: 0.711, Val Recall Macro: 0.500, Val

Precision Weighted : 0.957, Val Ham Loss : 0.022

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